

US009606848B2

# (12) United States Patent

# Wellman et al.

### (54) ITERATIVE KALMAN FILTERING

(71) Applicant: Raytheon Company, Waltham, MA

(US)

(72) Inventors: William H. Wellman, Santa Barbara,

CA (US); Eric J. Gudim, Goleta, CA (US); Lee M. Savage, Santa Barbara,

CA (US)

(73) Assignee: Raytheon Company, Waltham, MA

(US)

(\*) Notice: Subject to any disclaimer, the term of this

patent is extended or adjusted under 35

U.S.C. 154(b) by 89 days.

(21) Appl. No.: 13/796,707

(22) Filed: Mar. 12, 2013

(65) Prior Publication Data

US 2014/0281779 A1 Sep. 18, 2014

(51) **Int. Cl.** *G06F 11/07* (2006.01) *G01S 5/02* (2010.01)

(Continued)

(52) U.S. Cl.

CPC ....... *G06F 11/0706* (2013.01); *G01S 5/0221* (2013.01); *G01S 5/0294* (2013.01);

(Continued)

(58) Field of Classification Search

CPC .. G06F 11/0706; G01S 5/0221; G01S 5/0294; G01S 13/003; G01S 7/285; G01S 5/06

(Continued)

#### (56) References Cited

### U.S. PATENT DOCUMENTS

2002/0171586 A1 11/2002 Martorana et al. 2004/0233105 A1 11/2004 Benner et al. (Continued) (10) Patent No.: US 9,606,848 B2

(45) **Date of Patent:** Mar. 28, 2017

#### OTHER PUBLICATIONS

Kutty et al.; "Kalman Filter Using Quantile based Noise Estimation for Audio Restoration"; IEEE International Conference on Emerging Trends in Electrical and Computer Technology; Bangalore University; (2011).

Park et al.; "Dead Reckoning Navigation of a Mobile Robot Using an Indirect Kalman Filter"; IEEE International Conference on Multisensor Fusion and Integration for Intelligent Systems; (1996). Shehata et al.; "Joint Iterative Detection and Phase Noise Estimation Algorithms Using Kalman Filtering"; IEEE; (2009).

(Continued)

Primary Examiner — Albert Decady
Assistant Examiner — Kyle Vallecillo
(74) Attorney, Agent, or Firm — Burns & Levinson LLP;
Joseph M. Maraia

## (57) ABSTRACT

Several types of noise limit the performance of remote sensing systems, e.g., systems that determine the location, color, or shape of remote objects. When noise detected by sensors of the remote sensing systems is known and well estimated, a Kalman filter can converge on an accurate value without noise. However, non-Gaussian noise bursts can cause the Kalman filter to diverge from an accurate value. Current approaches arbitrarily boost noise with fixed additive or multiplicative factors, which slows filter response and often fails to give timely results. Such noise boosts prevent divergence due to badly corrupted measurements. Disclosed embodiments eliminate a subset of noise measurements having the largest errors from a data set of noise measurements and process the remaining data through the Kalman filter. Advantageously, disclosed embodiments enable a Kalman filter to converge on an accurate value without the introduction of noise boost estimates.

# 9 Claims, 7 Drawing Sheets

